Modeling Variability in the Influence of Terrain and Vegetation on Snowpack: Findings and Implications for Water Management in Snowmelt-fed Regions

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Abstract

- Current State: Operational methods for predicting water from seasonal snowmelt are imprecise and sparse.
- Challenge #1: Climate change will render historical relationships between point measurements of snow water equivalent (SWE, the amount of water contained in a column of snow) and summer streamflow invalid, necessitating new approaches to SWE measurement.
- Challenge #2: Terrain and vegetation-based models could aid snow distribution estimates, but little known about their stability across seasons, across years, or across model scales.
- Opportunity: New time series of gridded LiDAR-based snow measurements from the Tuolumne River Basin, with multiple collections between 2013-16.
- This study: Repeated regressions with numerous snapshots of gridded snow products (~70M pixels each) to assess model variability across time and scale.



Data and Methods

- Data: <u>Tuolumne River Basin SWE and</u> <u>Snow Depth</u>
 - 4 years (~10 dates per year) of 3m resolution "snapshots" of snow depth and SWE, ~1 GB per image
- Methods: <u>Comparison of feature</u> <u>importance across random forest</u> <u>regressions fitted to each snapshot</u>
 - Preprocessing: Parallel extraction of terrain features from Digital Elevation Map
 - Analysis: Parallel fitting of random forest models, themselves parallelized across ensemble members



Computational Tools: <u>National Center for</u> <u>Atmospheric Research Yellowstone</u> <u>Supercomputer</u>



Preliminary Results

Comparisons of feature importance in random forest models across the indicated temporal/scale dimensions reveal several consistent patterns:





Conclusions

Acknowledgements

- Consistent intra-annual variability observed in feature influence
 - Elevation most predictive in early winter (accumulation phase), least in summer (ablation)
 - Clear-sky Irradiance most predictive in spring
- Terrain and vegetation features better predictors in accumulation phase
- Relative importance of elevation decreases with increasing model resolution
 - Fine-scale topographic features are only well represented at fine resolutions
- Terrain and vegetation features similarly important when predicting depth and SWE
- Allowing for intraannual changes to model structure/parameters necessary for accurate snow distribution prediction using statistical terrain and vegetation-based models

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